# Analysis of Algorithms: <br> Sorting algorithms (Selection sort and Quicksort) 

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Course Notes: https://gdancik.github.io

## What do we mean by Sorting?

- One of the most common operations in computer science is to sort data numerically or alphabetically
- We have seen previously that sorted data can be searched much more efficiently than unsorted data. Why?
- In addition, for presentation purposes, elements such as names, states, ages, GPAs, etc, are often displayed in sorted order (numeric data may be sorted from low to high or high to low; when we say that numeric data is sorted we will mean low to high)
11

21
18
3
15
19

- The list above in sorted order is: $3,11,15,18,19$, and 21


## Selection sort

- Find the maximum element in the list (all $n$ elements)
- Swap this maximum element with the last element in the list
- Find the maximum element in the list (first $n-1$ elements)
- Swap this maximum element with the second to last element in the list
- Find the maximum element in the list (first $n-2$ elements)
- Swap this maximum element with the third to last element in the list
- This process repeats until we are down to the first element. This is the minimum element, which is now the first element in the list

| 11 | 21 | 18 | 3 | 15 | 19 |
| :--- | :--- | :--- | :--- | :--- | :--- |

## Selection sort (example)

- We search all $n=6$ elements for the maximum, and swap this maximum element with the last one in the list (the $6^{\text {th }}$ one)


The max is $21 \rightarrow$ swap this with the last element

| 11 | 19 | 18 | 3 | 15 | 21 |
| :--- | :--- | :--- | :--- | :--- | :--- |

## Selection sort (example)

- We search the first $n-1=5$ elements for the maximum, and swap this maximum element with the $5^{\text {th }}$ one (or the second to last one)


The max is $19 \rightarrow$ swap this with the $5^{\text {th }}$ element

| 11 | 15 | 18 | 3 | 19 | 21 |
| :--- | :--- | :--- | :--- | :--- | :--- |

## Selection sort (example)

- We search the first $n-2=4$ elements for the maximum, and swap this maximum element with the 4th one

Swap max with
This is the max this element


The max is $18 \rightarrow$ swap this with the $4^{\text {th }}$ element

| 11 | 15 | 3 | 18 | 19 | 21 |
| :--- | :--- | :--- | :--- | :--- | :--- |

## Selection sort (example)

- We search the first $\mathrm{n}-3=3$ elements for the maximum, and swap this maximum element with the $3^{\text {rd }}$ one

Swap max with
This is the max this element


The max is $15 \rightarrow$ swap this with the $3^{\text {rd }}$ element

| 11 | 3 | 15 | 18 | 19 | 21 |
| :--- | :--- | :--- | :--- | :--- | :--- |

## Selection sort (example)

- We search the first $\mathrm{n}-4=2$ elements for the maximum, and swap the maximum element with the $2^{\text {nd }}$ one

Swap max with
This is the max this element


The max is $11 \rightarrow$ swap this with the $2^{\text {nd }}$ element

| 3 | 11 | 15 | 18 | 19 | 21 |
| :--- | :--- | :--- | :--- | :--- | :--- |

## Selection sort (example)

- Once we have only 1 element left (we are finding the max of just the $1^{\text {st }}$ element), then we are done. The list is now sorted.


## Selection sort algorithm

- end $=\mathrm{n}-1$
- while end $>0$ :
- Set max_index to the index of the maximum element between values[0] through values[end]
- Swap values[max_index] and values[end]
- Set end = end - 1


## Selection sort algorithm

- end $=\mathrm{n}-1$
- while end $>0$ :
- Set max_index to the index of the maximum element between values[0] through values[end]
- Swap values[max_index] and values[end]
- Set end = end - 1
- Set max_index to 0
- Set $i$ to 0
- While $i$ <= end:
- If values[i] > values[max_index]:
- set max_index to $i$
- set $i=i+1$


## Selection sort algorithm

- end $=\mathrm{n}-1$
- while end $>0$ :
- Set max_index to 0
- Set $i$ to 0
- While $i<=$ end:
- If values[i] > values[max_index]:
- set max_index to l
- Set $i=i+1$
- Swap values[max_index] and values[end]
- Set end = end - 1


## Selection sort algorithm

Assume that $n=4$

- end $=\mathrm{n}-1$
- while end $>0$ :
- Set max_index to 0
- Set $i$ to 0
- While $i<=$ end:
- If values[i] > values[max_index]:
- set max_index to I
- Set $i=i+1$
- Swap values[max_index] and values[end]
- Set end = end - 1

| end | \# iterations of inner <br> while loop |
| :---: | :---: |
| 3 | 4 |
| 2 | 3 |
| 1 | 2 |
| 0 | - |

In general, for a list of size $n$, the total number of inner loop iterations is:
$2+3+4+\ldots .+n$
This is $n(n+1) / 2-1$, which has an order of magnitude of $n^{2}$.

## Quicksort algorithm

- Quicksort(arr, low, high) :
- While low < high :
- pi = partition (arr, low, high)
- Quicksort(arr, low, pi-1)
- Quicksort(arr, pi + 1, high)


## Partition step:

- select a pivot
- move pivot to correct location
- all elements less than pivot are moved to its left
- all elements greater than pivot are moved to its right
- Return partition index


| 2 | 1 | 3 | 4 | 5 |
| :--- | :--- | :--- | :--- | :--- |

Pivot is in the correct location

## Partition algorithm

- Inputs:

- arr (the list/array)
- low (index of lower element),
- high (index of last element, which will be the pivot)
- Set left = low
- Set pivot = arr[high]
- Set right = high - 1
- While left <= right:
- Increase left by 1 until arr[left] > pivot (or left > right)
- Decrease right by 1 until arr[right] <= pivot (or left > right)
- If left < right, swap arr[left] and arr[right]
- Increase left by 1
- Decrease right by 1

left right

- Swap arr[left] and arr[high]
- Return left


## Quicksort example



## Quicksort example



## Quicksort running times

- The worst case occurs if the original data is sorted, then the partition will keep the pivot in the last element and we will call quicksort on $\mathrm{L} 1=$ list containing all elements but the last one; L 2 has no elements. The running time is $\theta\left(n^{2}\right)$
- Also see https://www.khanacademy.org/computing/computer-science/algorithms/quick-sort/a/analysis-ofquicksort

| 1 | 2 | 3 | 4 | 5 | 6 |
| :--- | :--- | :--- | :--- | :--- | :--- |$\quad$ Partition looks at 6 elements


| 1 | 2 | 3 | 4 | 5 |
| :--- | :--- | :--- | :--- | :--- | Call quicksort on L1 Partition looks at 5 elements


|     <br> 1 2 3 4 | Partition looks at 4 elements | The total number of elements we look at is: $2+3+\ldots .+n$ |
| :---: | :---: | :---: |
|  | Partition looks at 3 elements | which is $\theta\left(n^{2}\right)$ |
|  | Partition looks at 2 elements |  |

## Quicksort running times

- The best case occurs when the partitions are evenly balanced. In this case the number of sub-list pairs that get sorted is $\log n$. The running time is $\theta(n \log n)$.
- Also see https://www.khanacademy.org/computing/computer-science/algorithms/quick-sort/a/analysis-ofquicksort


The total number of elements we look at is approximately $11 \times\lfloor\log n\rfloor$ which is $\theta(n \log n)$

## Selection sort and Quicksort algorithms

|  | Selection sort |  | Quicksort |  |
| ---: | :---: | :---: | :---: | :---: |
|  | Time | Additional <br> Space | Time | Additional |
|  |  | $\theta(1)$ | $\theta(n \log n)$ | $\theta(\log n)$ |
| Best | $\theta\left(n^{2}\right)$ | $\theta(1)$ | $\theta\left(n^{2}\right)$ | $\theta(n)$ |
| Worst | $\theta\left(n^{2}\right)$ | $\theta(1)$ | $\theta(n \log n)$ | $\theta(\log n)$ |
| Average | $\theta\left(n^{2}\right)$ |  |  |  |

- Which algorithm is the best?


## When a function is called, information is stored in the call stack

Call stack

$\rightarrow \mathrm{a}=1$
$\operatorname{def} f(x)$ :
$b=2$
return $b+x$
$y=f(a)$
print(y)

Call stack

$a=1$
$\operatorname{def} f(x)$ :
$\rightarrow \quad b=2$
return $b+x$
$y=f(a)$
print(y)

Call stack

$a=1$
$\operatorname{def} f(x)$ :
$b=2$
return $b+x$ $y=f(a)$
$\rightarrow \operatorname{print}(y)$

In quicksort, recursive function calls are stored on the stack,

- $n$ times in the worst case
- roughly $\log n$ times in the best/average case.

